

NLP Project : SENTIMENT ANALYSIS

Twitter validation

1)Import required libraries

```
In [ ]: import numpy as np
import pandas as pd
import nltk
import seaborn as sns
import matplotlib.pyplot as plt
import re #regularexpression(remove specialcharacters)
```

```
In [ ]: df=pd.read_csv('/content/twitter_validation.csv',encoding='ISO-8859-1',header=None)
df.columns=['Id','Media','Target','Text']
df
```

Out[]:

	Id	Media	Target	Text
0	3364	Facebook	Irrelevant	I mentioned on Facebook that I was struggling ...
1	352	Amazon	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...
2	8312	Microsoft	Negative	@Microsoft Why do I pay for WORD when it funct...
3	4371	CS-GO	Negative	CSGO matchmaking is so full of closet hacking,...
4	4433	Google	Neutral	Now the President is slapping Americans in the...
...
995	4891	GrandTheftAuto(GTA)	Irrelevant	â€¦, Toronto is the arts and culture capital...
996	4359	CS-GO	Irrelevant	tHIS IS ACTUALLY A GOOD MOVE TOT BRING MORE VI...
997	2652	Borderlands	Positive	Today sucked so itâ€™s time to drink wine n pl...
998	8069	Microsoft	Positive	Bought a fraction of Microsoft today. Small wins.
999	6960	johnson&johnson	Neutral	Johnson & Johnson to stop selling talc baby po...

1000 rows x 4 columns

```
In [ ]: df.head()
```

Out[]:

	Id	Media	Target	Text
0	3364	Facebook	Irrelevant	I mentioned on Facebook that I was struggling ...
1	352	Amazon	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...
2	8312	Microsoft	Negative	@Microsoft Why do I pay for WORD when it funct...
3	4371	CS-GO	Negative	CSGO matchmaking is so full of closet hacking,...
4	4433	Google	Neutral	Now the President is slapping Americans in the...

```
In [ ]: df.tail()
```

Out[]:

		Id	Media	Target	Text
995	4891	GrandTheftAuto(GTA)	Irrelevant		â Toronto is the arts and culture capital...
996	4359		CS-GO	Irrelevant	tHIS IS ACTUALLY A GOOD MOVE TOT BRING MORE VI...
997	2652		Borderlands	Positive	Today sucked so itâs time to drink wine n pl...
998	8069		Microsoft	Positive	Bought a fraction of Microsoft today. Small wins.
999	6960		johnson&johnson	Neutral	Johnson & Johnson to stop selling talc baby po...

In []:

```
df.isna().sum()
```

Out[]:

```
Id      0
Media   0
Target  0
Text    0
dtype: int64
```

In []:

```
df.dtypes
```

Out[]:

```
Id      int64
Media   object
Target  object
Text    object
dtype: object
```

2)Find Value count and Data Visualization

In []:

```
df['Target'].value_counts()
```

Out[]:

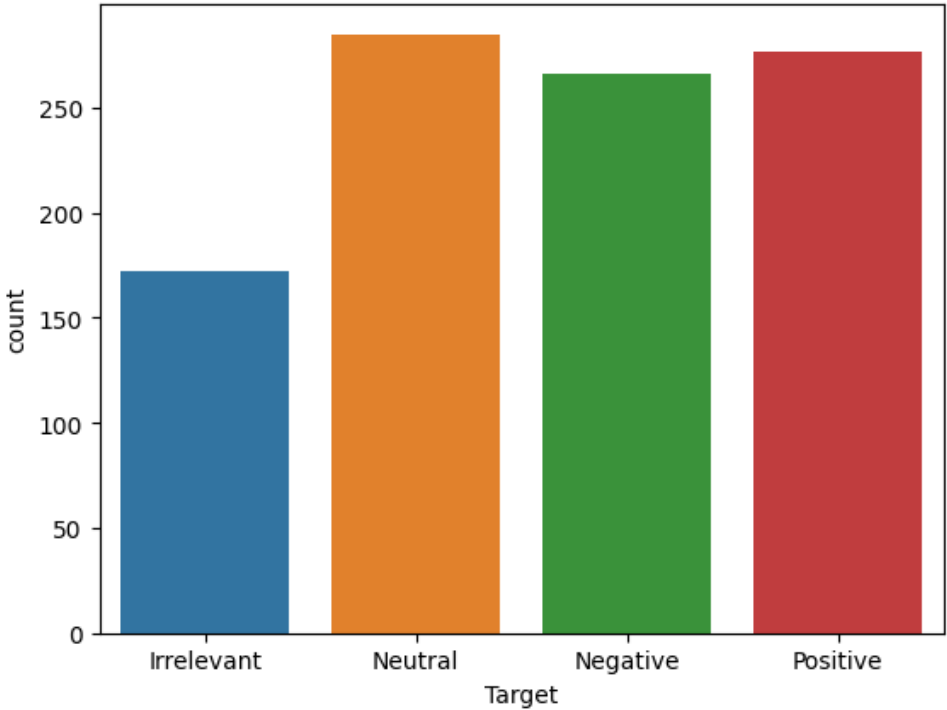
```
Neutral      285
Positive     277
Negative     266
Irrelevant   172
Name: Target, dtype: int64
```

In []:

```
sns.countplot(x='Target',data=df)
```

Out[]:

```
<Axes: xlabel='Target', ylabel='count'>
```



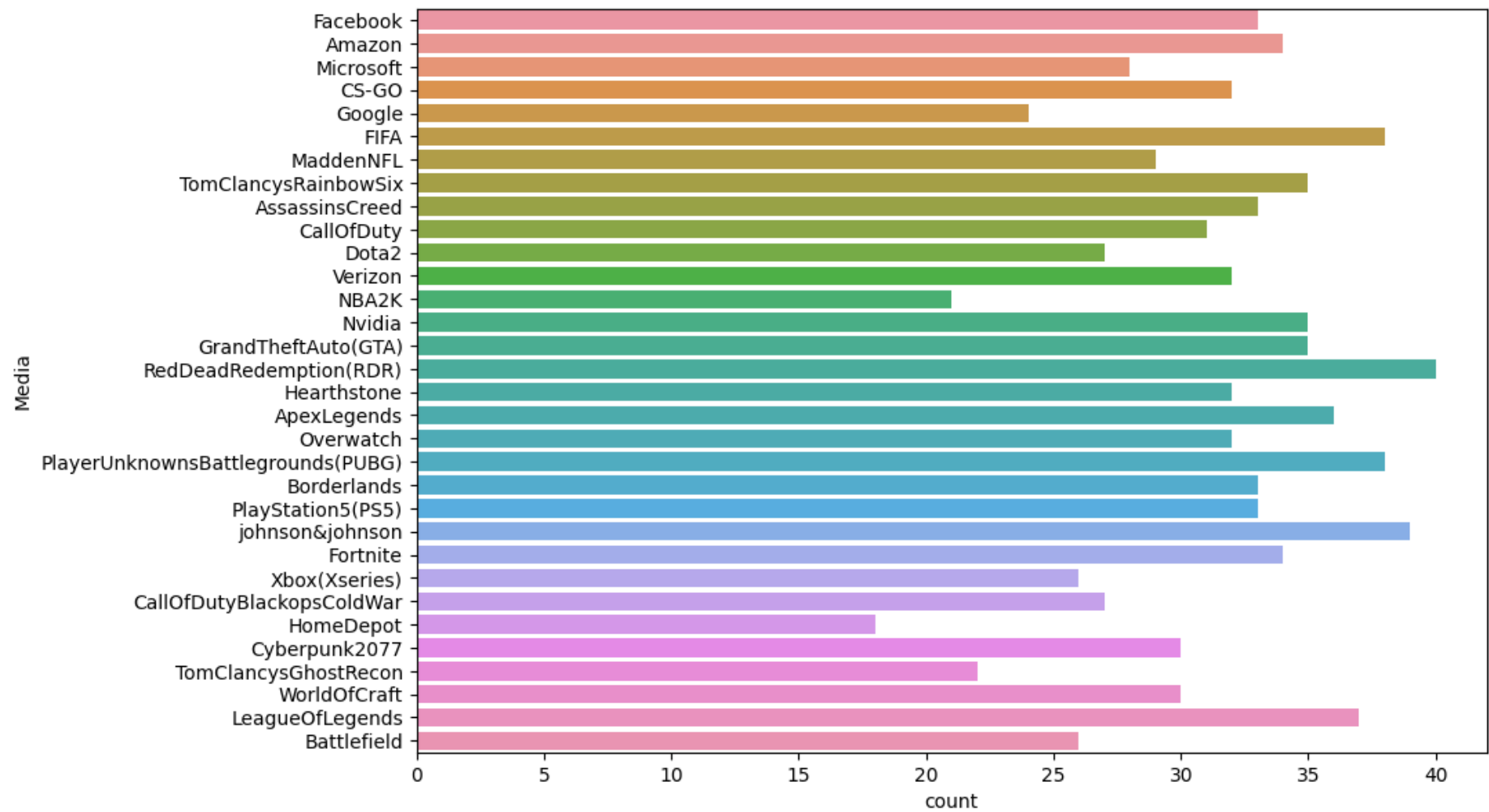
In []:

```
df['Media'].value_counts()
```

```
Out[ ]: RedDeadRedemption(RDR)      40
        johnson&johnson              39
        FIFA                        38
        PlayerUnknownsBattlegrounds(PUBG) 38
        LeagueOfLegends             37
        ApexLegends                 36
        TomClancysRainbowSix        35
        Nvidia                      35
        GrandTheftAuto(GTA)        35
        Amazon                      34
        Fortnite                    34
        Facebook                    33
        PlayStation5(PS5)          33
        AssassinsCreed              33
        Borderlands                 33
        Overwatch                   32
        Hearthstone                 32
        Verizon                     32
        CS-GO                       32
        CallOfDuty                  31
        Cyberpunk2077               30
        WorldOfCraft                30
        MaddenNFL                  29
        Microsoft                   28
        Dota2                       27
        CallOfDutyBlackopsColdWar   27
        Xbox(Xseries)               26
        Battlefield                  26
        Google                       24
        TomClancysGhostRecon        22
        NBA2K                       21
        HomeDepot                   18
        Name: Media, dtype: int64
```

```
In [ ]: plt.figure(figsize=(10,7))
        sns.countplot(y='Media',data=df)
```

```
Out[ ]: <Axes: xlabel='count', ylabel='Media'>
```



3) Dropping irrelevant values in Rows & Reseting index

```
In [ ]: df.drop(df.index[(df['Target']=='Irrelevant')],axis=0,inplace=True)
#or
#df.loc[df['Target']!='Irrelevant']
df
```

Out []:		Id	Media	Target	Text
1	352	Amazon	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...	
2	8312	Microsoft	Negative	@Microsoft Why do I pay for WORD when it funct...	
3	4371	CS-GO	Negative	CSGO matchmaking is so full of closet hacking,...	
4	4433	Google	Neutral	Now the President is slapping Americans in the...	
5	6273	FIFA	Negative	Hi @EAHelp Iâve had Madeleine McCann in my c...	
...	
993	314	Amazon	Negative	Please explain how this is possible! How can t...	
994	9701	PlayStation5(PS5)	Positive	Good on Sony. As much as I want to see the new...	
997	2652	Borderlands	Positive	Today sucked so itâs time to drink wine n pl...	
998	8069	Microsoft	Positive	Bought a fraction of Microsoft today. Small wins.	
999	6960	johnson&johnson	Neutral	Johnson & Johnson to stop selling talc baby po...	

828 rows × 4 columns

```
In [ ]: df['Target'].unique()
```

Out[]: array(['Neutral', 'Negative', 'Positive'], dtype=object)

```
In [ ]: #resetindex
df.reset_index(drop=True,inplace=True)
df
```

Out[]:

		Id	Media	Target	Text
	0	352	Amazon	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...
	1	8312	Microsoft	Negative	@Microsoft Why do I pay for WORD when it funct...
	2	4371	CS-GO	Negative	CSGO matchmaking is so full of closet hacking,...
	3	4433	Google	Neutral	Now the President is slapping Americans in the...
	4	6273	FIFA	Negative	Hi @EAHelp Iâve had Madeleine McCann in my c...

	823	314	Amazon	Negative	Please explain how this is possible! How can t...
	824	9701	PlayStation5(PS5)	Positive	Good on Sony. As much as I want to see the new...
	825	2652	Borderlands	Positive	Today sucked so itâs time to drink wine n pl...
	826	8069	Microsoft	Positive	Bought a fraction of Microsoft today. Small wins.
	827	6960	johnson&johnson	Neutral	Johnson & Johnson to stop selling talc baby po...

828 rows × 4 columns

```
In [ ]: df.drop(['Id', 'Media'],axis=1,inplace=True)
df
```

Out[]:

	Target	Text	
	0	Neutral	BBC News - Amazon boss Jeff Bezos rejects clai...
	1	Negative	@Microsoft Why do I pay for WORD when it funct...
	2	Negative	CSGO matchmaking is so full of closet hacking,...
	3	Neutral	Now the President is slapping Americans in the...
	4	Negative	Hi @EAHelp Iâve had Madeleine McCann in my c...

	823	Negative	Please explain how this is possible! How can t...
	824	Positive	Good on Sony. As much as I want to see the new...
	825	Positive	Today sucked so itâs time to drink wine n pl...
	826	Positive	Bought a fraction of Microsoft today. Small wins.
	827	Neutral	Johnson & Johnson to stop selling talc baby po...

828 rows × 2 columns

4)Replace String to Numeric

```
In [ ]: df['Target']=df['Target'].map({'Positive':1,'Negative':-1,'Neutral':0})
df
#df['Target']=df['Target'].str.replace('Positive','1')
#df['Target']=df['Target'].str.replace('Negative','-1')
#df['Target']=df['Target'].str.replace('Neutral','0')
```

Out[]:

	Target	Text
0	0	BBC News - Amazon boss Jeff Bezos rejects clai...
1	-1	@Microsoft Why do I pay for WORD when it funct...
2	-1	CSGO matchmaking is so full of closet hacking,...
3	0	Now the President is slapping Americans in the...
4	-1	Hi @EAHelp Iâve had Madeleine McCann in my c...
...
823	-1	Please explain how this is possible! How can t...
824	1	Good on Sony. As much as I want to see the new...
825	1	Today sucked so itâs time to drink wine n pl...
826	1	Bought a fraction of Microsoft today. Small wins.
827	0	Johnson & Johnson to stop selling talc baby po...

828 rows × 2 columns

5)Download for NLP

In []:

```
nltk.download('stopwords')
nltk.download('punkt')
nltk.download('wordnet')
nltk.download('omw-1.4')
```

[nltk_data] Downloading package stopwords to /root/nltk_data...
[nltk_data] Unzipping corpora/stopwords.zip.
[nltk_data] Downloading package punkt to /root/nltk_data...
[nltk_data] Unzipping tokenizers/punkt.zip.
[nltk_data] Downloading package wordnet to /root/nltk_data...
[nltk_data] Downloading package omw-1.4 to /root/nltk_data...

Out[]:

True

6)Assigning to a variable output column

In []:

```
tweets=df.Text
tweets
```

Out[]:

```
0      BBC News - Amazon boss Jeff Bezos rejects clai...
1      @Microsoft Why do I pay for WORD when it funct...
2      CSGO matchmaking is so full of closet hacking,...
3      Now the President is slapping Americans in the...
4      Hi @EAHelp Iâve had Madeleine McCann in my c...
      ...
823     Please explain how this is possible! How can t...
824     Good on Sony. As much as I want to see the new...
825     Today sucked so itâs time to drink wine n pl...
826     Bought a fraction of Microsoft today. Small wins.
827     Johnson & Johnson to stop selling talc baby po...
Name: Text, Length: 828, dtype: object
```

7)Tokenization using TweetTokenizer

In []:

```
#Tokenization
#TweetTokenizer
from nltk import TweetTokenizer
tk=TweetTokenizer()
tweets=tweets.apply(lambda x:tk.tokenize(x)).apply(lambda x:" ".join(x))
tweets
```

```
Out[ ]: 0      BBC News - Amazon boss Jeff Bezos rejects clai...
        1      @Microsoft Why do I pay for WORD when it funct...
        2      CSGO matchmaking is so full of closet hacking ...
        3      Now the President is slapping Americans in the...
        4      Hi @EAHelp Iâve had Madeleine McCann in m...
        ...
        823     Please explain how this is possible ! How can ...
        824     Good on Sony . As much as I want to see the ne...
        825     Today sucked so itâs time to drink wine n...
        826     Bought a fraction of Microsoft today . Small w...
        827     Johnson & Johnson to stop selling talc baby po...
Name: Text, Length: 828, dtype: object
```

8)Remove Special characters using re (Regular expression)

```
In [ ]: #Remove special characters
        #Regular expression
        tweets=tweets.str.replace('[^a-zA-Z0-9]+',' ')
        tweets
```

```
In [ ]: from nltk.tokenize import word_tokenize
        tweets=tweets.apply(lambda x:' '.join([w for w in word_tokenize(x) if len(w)>=3]))
        tweets
```

```
Out[ ]: 0      BBC News Amazon boss Jeff Bezos rejects claims...
        1      Microsoft Why pay for WORD when functions poor...
        2      CSGO matchmaking full closet hacking truly awf...
        3      Now the President slapping Americans the face ...
        4      EAHelp had Madeleine McCann cellar for the pas...
        ...
        823     Please explain how this possible How can they ...
        824     Good Sony much want see the new PS5 what going...
        825     Today sucked time drink wine play borderlands ...
        826     Bought fraction Microsoft today Small wins
        827     Johnson Johnson stop selling talc baby powder ...
Name: Text, Length: 828, dtype: object
```

9)Stemming using SnowballStemmer

```
In [ ]: #Stemming
        from nltk.stem import SnowballStemmer
        stemmer=SnowballStemmer('english')
        tweets=tweets.apply(lambda x:[stemmer.stem(i.lower()) for i in tk.tokenize(x)]).apply(lambda x:' '.join(x))
        tweets
```

```
Out[ ]: 0      bbc news amazon boss jeff bezo reject claim co...
        1      microsoft whi pay for word when function poor ...
        2      csgo matchmak full closet hack truli aw game
        3      now the presid slap american the face that rea...
        4      eahelp had madelein mccann cellar for the past...
        ...
        823     pleas explain how this possibl how can they le...
        824     good soni much want see the new ps5 what go ri...
        825     today suck time drink wine play borderland unt...
        826     bought fraction microsoft today small win
        827     johnson johnson stop sell talc babi powder and...
Name: Text, Length: 828, dtype: object
```

10)Remove Stopwords

```
In [ ]: #Remove Stopwords
        from nltk.corpus import stopwords
        stop=stopwords.words('english')
        tweets=tweets.apply(lambda x:[i for i in word_tokenize(x) if i not in stop]).apply(lambda x:' '.join(x))
        tweets
```

```
Out[ ]: 0      bbc news amazon boss jeff bezo reject claim co...
        1      microsoft whi pay word function poor samsungus...
        2          csgo matchmak full closet hack truli aw game
        3      presid slap american face realli commit unlaw ...
        4      eaahelp madelein mccann cellar past year littl ...
        ...
        823     pleas explain possibl let compani overcharg sc...
        824     good soni much want see new ps5 go right much ...
        825     today suck time drink wine play borderland sun...
        826          bought fraction microsoft today small win
        827     johnson johnson stop sell talc babi powder can...
Name: Text, Length: 828, dtype: object
```

11)Vectorization

```
In [ ]: from sklearn.feature_extraction.text import TfidfVectorizer
        vec=TfidfVectorizer()
        train_data=vec.fit_transform(tweets)
```

```
In [ ]: print(train_data)
```



```
(0, 691)      0.2608257828483461
(0, 1004)     0.2608257828483461
(0, 1130)     0.23509805002803952
(0, 1996)     0.13277165480466424
(0, 309)      0.22681557001542715
(0, 860)      0.17354914655342313
(0, 807)      0.21432663830218204
(0, 2761)     0.2608257828483461
(0, 568)      0.2608257828483461
(0, 1833)     0.24577602391989378
(0, 633)      0.22681557001542715
(0, 376)      0.1515362387424402
(0, 2287)     0.38864111655856126
(0, 538)      0.49155204783978756
(1, 797)      0.4055823664694651
(1, 2891)     0.4055823664694651
(1, 2558)     0.3821800909185634
(1, 1405)     0.4055823664694651
(1, 3679)     0.36557591217188057
(1, 2462)     0.3126902562590763
(1, 3639)     0.26216072802580975
(1, 2155)     0.24555654927912696
(2, 1427)     0.1689251539717079
(2, 486)      0.36574263611909275
(2, 3432)     0.36574263611909275
:             :
(825, 3393)   0.3395996844494919
(825, 3383)   0.2560582225152134
(825, 631)    0.22981061112100945
(825, 997)    0.2315686698425631
(825, 3373)   0.21750175079084832
(825, 3226)   0.2904718522758868
(825, 2527)   0.17148706662740873
(826, 1381)   0.5079831062080814
(826, 3070)   0.47867226429410115
(826, 636)    0.4174215841659411
(826, 3650)   0.353278941165688
(826, 3383)   0.34523850330234374
(826, 2155)   0.3075542453642147
(827, 195)    0.3283693467320579
(827, 1132)   0.3283693467320579
(827, 2808)   0.3283693467320579
(827, 143)    0.3283693467320579
(827, 712)    0.2770320970909926
(827, 2946)   0.2635889502019104
(827, 3274)   0.2635889502019104
(827, 3193)   0.2311987519368367
(827, 1686)   0.15963411936668057
(827, 2576)   0.24870786898500463
(827, 506)    0.23743856420618148
(827, 1854)   0.3947412386878786
```

```
In [ ]: train_data.shape
```

Out[]: (828, 3783)

```
In [ ]: x=train_data
x
```

Out[]: <828x3783 sparse matrix of type '<class 'numpy.float64'>'
with 10505 stored elements in Compressed Sparse Row format>

```
In [ ]: y=df['Target'].values
y
```

```
Out[ ]: array([ 0, -1, -1,  0, -1,  1,  1,  1, -1,  1,  1, -1,  0, -1,  1,  1, -1,
               1, -1, -1,  0, -1,  0,  0, -1, -1,  1,  1, -1,  1, -1,  0,  0,  1,
               0,  1,  0,  0,  0,  1,  0, -1, -1, -1,  0,  1, -1, -1,  1,  1,  1,
               1,  1, -1, -1,  1,  1, -1,  0, -1,  0, -1,  1, -1, -1,  1,  1,  1,
               0,  0,  0,  1,  1,  0,  1,  0, -1, -1,  0,  0, -1,  1, -1, -1, -1,
               0,  1,  0, -1,  1,  1,  0,  1,  0,  1, -1,  0,  0,  0, -1,  0, -1,
               0,  0,  1,  1,  0, -1, -1,  1, -1,  0, -1,  1,  0, -1,  0,  1,  0,
               1,  1,  0,  0,  0,  0,  1,  0,  1,  1, -1,  0,  0,  0,  0, -1,  0,
               1, -1,  0, -1,  0, -1, -1, -1,  1,  1,  1,  0,  0,  1,  0,  0,  0,
               1,  0, -1, -1,  0,  1,  1,  0,  1,  1,  0,  0, -1, -1, -1, -1,  1,
               0,  0,  1,  1,  1,  1, -1,  1,  1,  0, -1, -1, -1,  1,  1, -1, -1,
               1,  1, -1,  1,  1, -1,  1,  0, -1,  0,  0,  1, -1,  1,  1,  0,  1,
               -1, -1,  1,  1,  1,  1,  0,  0,  1, -1,  0,  1,  0, -1,  0,  0,  1,
               1,  1, -1,  0,  1,  0, -1,  0, -1,  1,  1, -1, -1, -1,  1, -1,  0,
               1,  0,  0, -1,  1, -1,  1, -1,  0,  0,  1, -1,  0, -1,  1, -1,  1,
               1,  1,  1,  1,  1, -1, -1,  1, -1,  0,  0,  1, -1,  0,  1, -1,  0,
               0,  0,  0, -1,  1, -1, -1,  1,  1,  0,  0, -1, -1, -1,  0,  1,  0,
               -1,  1,  0, -1, -1, -1,  1,  0,  0, -1,  1,  1,  0,  1,  0,  0,  1,
               1, -1,  0,  1, -1,  0, -1, -1,  1,  1,  1,  0, -1,  0,  1,  0,
               1, -1, -1, -1,  1,  0,  1, -1,  0, -1,  1,  1,  1,  0,  0,  0,
               -1,  1,  1,  0, -1,  1,  0, -1, -1, -1, -1, -1,  0,  0,  0,  1,  1,
               -1, -1,  0, -1,  0,  0, -1,  1, -1,  1,  1,  1,  0,  1,  0,  0, -1,
               1,  0,  0,  0,  0,  0,  0,  0,  0, -1, -1,  1,  1,  0, -1, -1,  1,
               1, -1,  1,  1,  1,  1,  1,  0, -1,  1,  0,  0,  1,  1,  1,  1,  0,
               -1, -1, -1, -1,  0,  1, -1, -1,  1,  1,  0,  0, -1, -1,  1,  0, -1,
               -1, -1,  0,  1, -1, -1, -1,  1,  1,  0,  0, -1, -1,  1, -1,  0, -1,
               -1, -1,  0,  1, -1,  0, -1, -1, -1,  1,  1,  1,  0, -1, -1,  1,  0,
               1, -1,  0,  1, -1,  0, -1, -1, -1,  1,  1, -1, -1,  0,  1,  0, -1,
               1,  0,  1, -1, -1,  0,  1,  1, -1,  0,  1,  1,  0,  0, -1,  1,  0,
               0, -1, -1, -1,  1, -1,  1, -1,  1, -1, -1,  0, -1,  0, -1,  1, -1,
               0, -1, -1,  0,  0,  1, -1,  1,  0,  0,  0,  0, -1,  0,  0,  0, -1,
               -1,  0,  1,  0,  0, -1,  0,  1,  0,  0,  0,  0,  0,  1,  0,  1,  1,
               1,  0, -1,  1,  0,  0, -1,  1,  0,  0, -1,  0, -1,  0,  1, -1,  1,
               -1, -1,  0,  0,  0,  0,  1,  1,  1, -1, -1,  0,  1,  0,  0, -1,  1,
               1,  0,  1, -1, -1,  0,  1,  1,  1, -1, -1,  0,  1,  0,  0, -1,  1,
               1,  0,  1, -1, -1,  0,  1, -1,  1, -1,  0,  1,  1,  0,  0,  0,  1,
               0, -1,  0,  0, -1,  1, -1,  0,  1,  1,  1,  0, -1,  0,  1,  1,
               1,  1,  1, -1,  0,  1,  0,  0, -1, -1, -1,  0,  1,  0, -1,  1,  1,
               1,  0,  1, -1,  0, -1,  0, -1,  0,  0,  1, -1,  1,  1,  0, -1,  0,
               -1, -1, -1, -1,  1,  1,  1,  1,  0, -1, -1,  1, -1, -1,  0,  0,  1,
               0, -1,  0,  1, -1,  0,  1, -1,  0,  0,  1, -1,  0, -1,  1,  1,  0,
               1,  0,  1, -1,  0,  0,  0,  1,  0,  0, -1,  1,  0, -1, -1,  0,  0,
               1, -1, -1, -1, -1,  1,  0,  0,  1,  0, -1,  1,  1, -1,  1,  1,  0,
               -1,  0,  1,  1, -1, -1, -1,  1, -1,  0, -1,  0,  0,  1,  1, -1,  0,
               1, -1, -1, -1, -1, -1, -1, -1, -1,  0, -1,  0,  0,  0,  1,  0,  0,
               0, -1,  0,  1,  0, -1, -1,  1,  0,  1,  0,  1,  0, -1,  1,  1,  1,
               1, -1, -1,  1,  0,  0,  0,  0,  0,  0, -1, -1, -1, -1,  1, -1,  0,
               1,  0, -1,  1,  1, -1,  1,  0,  0,  1, -1,  0, -1,  0,  1,  1,  0,
               -1,  1, -1, -1,  0, -1,  0, -1,  1,  0, -1, -1,  1,  1, -1,  0, -1,
               0,  0,  0,  0,  0,  0,  1,  0,  1,  1,  1, -1,  0,  1,  0,  1,  0,
               1,  0,  1,  0, -1, -1,  1,  1,  1,  1,  0, -1,  1,  1, -1, -1, -1,
               0,  1,  0,  1,  1,  0,  1, -1,  1,  1,  1,  0])
```

12)Split the data into Training & Testing data

```
In [ ]: from sklearn.model_selection import train_test_split
x_train,x_test,y_train,y_test=train_test_split(x,y,test_size=0.30,random_state=42)
```

13)Model Creation

- knn
- Naive_bayes
- SVM

```
In [ ]: from sklearn.neighbors import KNeighborsClassifier
from sklearn.naive_bayes import BernoulliNB
from sklearn.svm import SVC
knn=KNeighborsClassifier(n_neighbors=7)
model=BernoulliNB()
modell=SVC()
lst=[knn,model,modell]
```

14)Performance Evaluation

```
In [ ]: from sklearn.metrics import confusion_matrix,accuracy_score,classification_report
        for i in lst:
            print(i)
            i.fit(x_train,y_train)
            y_pred=i.predict(x_test)
            print(accuracy_score(y_test,y_pred))
            print(confusion_matrix(y_test,y_pred))
            print(classification_report(y_test,y_pred))
```

KNeighborsClassifier(n_neighbors=7)
0.46987951807228917
[[57 13 9]
[34 29 16]
[46 14 31]]

	precision	recall	f1-score	support
-1	0.42	0.72	0.53	79
0	0.52	0.37	0.43	79
1	0.55	0.34	0.42	91
accuracy			0.47	249
macro avg	0.50	0.48	0.46	249
weighted avg	0.50	0.47	0.46	249

BernoulliNB()
0.5823293172690763
[[54 7 18]
[14 29 36]
[22 7 62]]

	precision	recall	f1-score	support
-1	0.60	0.68	0.64	79
0	0.67	0.37	0.48	79
1	0.53	0.68	0.60	91
accuracy			0.58	249
macro avg	0.60	0.58	0.57	249
weighted avg	0.60	0.58	0.57	249

SVC()
0.5823293172690763
[[41 34 4]
[9 60 10]
[11 36 44]]

	precision	recall	f1-score	support
-1	0.67	0.52	0.59	79
0	0.46	0.76	0.57	79
1	0.76	0.48	0.59	91
accuracy			0.58	249
macro avg	0.63	0.59	0.58	249
weighted avg	0.64	0.58	0.58	249

```
In [ ]:
```